# Introduction to <br> Zero-Knowledge Proofs 

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## Speaker

- Thibauld Feneuil
- Cryptographer @ CryptoExperts
- PhD Defense in October 2023
- Main Research Area: MPC-in-the-Head paradigm, post-quantum signatures


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## Lectures

- 9h-10h30: Introduction to Zero-Knowledge Proofs
- 11h-12h30: Post-Quantum Signatures from Secure Multiparty Computation


## Modern Cryptography

- Secure Communication
- Encryption for the confidentiality
- MAC / signatures for the authentication and integrity


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- Secure Computation
- Multiparty Computation
- Homomorphic Encryption
- (Zero-Knowledge) Proof Systems
- ...


## Modern Cryptography

- Secure Communication
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## Definition and Properties

$C, x$ and $y$ are public


## $C, x$ and $y$ are public



- I know two non-trivial integers $p$ and $q$ such that $p \cdot q=15$.
- $x$ is not used
- $w$ is the couple $(p, q)$
- $C$ is the multiplication algorithm
- $y$ is the value 15


## $C, x$ and $y$ are public



- Given a graph $G$, I know a 3-coloration of this graph.
- $x$ is the graph $G$
- $w$ is the 3 -coloration
- $C$ is the verification algorithm
- $y$ is the value "True"


## $C, x$ and $y$ are public



- I know the password of this encrypted file.
- $x$ is the encrypted file
- $w$ is the password
- $C$ is an algorithm checking if the password is valid
- $y$ is the value "True"

- I claim that the $100^{\text {th }}$ term of the Fibonacci sequence is 354224848179261915075.
- $x$ is the index 100
- $C$ is the algorithm for the Fibonacci sequence
- $y$ is the integer 354224848179261915075 .


## $C, x$ and $y$ are public



- I claim that the product of the two matrices $X$ and $Y$ is equal to the matrix $Z$.
- $x$ is the two matrices $X$ and $Y$
- $C$ is the multiplication algorithm
- $y$ is the matrix $Z$

- I claim that the number of occurrences of the word "mais" in the book "A la Recherche du Temps Perdu" written by Marcel Proust is 8256.
- $x$ is the text of the book
- $C$ is the counting algorithm for the word "mais".
- $y$ is the number 8256

- Completeness: if the prover is honest (i.e. if his claim is correct), the verifier should be convinced at the end of the discussion.
- Soundness: if the prover is malicious (i.e. if his claim is invalid), the verifier should not be convinced at the end of the discussion.

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Zero-Knowledge: the verifier should learn nothing about the witness $w$, not even a partial information.


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Given a graph $G$, I know a 3-coloration of this graph.


Prover



Verifier

## Background: Commitment Scheme



- Binding: the opened value is ensured to be committed data $x$.
- Hiding: leaks no information about the committed data $x$ (without $\subset \rightarrow$ ).

Given a graph $G$, I know a 3-coloration of this graph.


Prover



Verifier

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Malicious Prover



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Malicious Prover


## Given a graph $G$, I know a 3-coloration of this graph.



Probability to catch a malicious prover $\geq \frac{1}{\mathrm{nb} \text { edges }}$

Probability $\varepsilon$ to fail to detect a malicious prover:
With 1 try: $\varepsilon \leq 1-\frac{1}{\text { nb edges }}$
With 2 tries: $\varepsilon \leq\left(1-\frac{1}{\mathrm{nb} \text { edges }}\right)^{2}$

With $\tau$ tries: $\varepsilon \leq\left(1-\frac{1}{\mathrm{nb} \text { edges }}\right)^{\tau}$

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With $\tau$ tries: $\varepsilon \leq\left(1-\frac{1}{\mathrm{nb} \text { edges }}\right)^{\tau}$

For a graph with 100 edges

1 try: 99.00 \%
2 tries: 98.01 \%
3 tries: 97.03 \%

100 tries: $36.60 \%$
458 tries: $1.00 \%$
1000 tries: 0.004 \%


- Perfect Completeness:

$$
\text { Prob [verifier convinced | prover honest] = } 1
$$

- Statistical Soundness:

Prob [verifier convinced | prover malicious] $\leq \varepsilon$


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Efficiency: the verifier should be faster than the time required to compute $C(x)$.

I claim that the product of the matrices $X$ and $Y$ is equal to $Z$.


Matrices $X, Y, Z \in \mathbb{F}_{q}^{n \times n}$

- Freivalds' Algorithm
- The verifier samples a vector $r \in \mathbb{F}_{q}^{n}$
- The verifier computes

$$
v \leftarrow X(Y r)-Z r .
$$

- Accept the claim iff $v=0$
- Completeness

$$
v=X(Y r)-Z r=(X Y-Z) r=0
$$



Verifier

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$$
\begin{aligned}
& \qquad v=\left(\begin{array}{ccc} 
& \vdots & \\
\cdots & m_{i, j} & \cdots \\
\vdots &
\end{array}\right)\left(\begin{array}{c}
\vdots \\
r_{j} \\
\vdots
\end{array}\right) \text { with } m_{i, j} \neq 0 \\
& \text { So, } \\
& v_{i}=r_{j} \cdot m_{i, j}+\ldots \sim \mathscr{U}\left(\mathbb{F}_{q}\right) \\
& \operatorname{Prob}[v=0 \mid X Y \neq Z] \geq \operatorname{Prob}\left[v_{i}=0 \mid X Y \neq Z\right]=\frac{1}{q}
\end{aligned}
$$

I claim that the product of the matrices $X$ and $Y$ is equal to $Z$.


Prover

$O\left(n^{2.37286}\right)$
$O\left(n^{2}\right)$




Efficiency: the communication between the prover and the verifier should be small.

## Proof Systems — Properties

- Completeness
- Soundness


## Optional properties:

- Zero-Knowledge
- Efficient Verification
- Short communication




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## Proof Systems — Properties

- Completeness
- Soundness


## Optional properties:

- Zero-Knowledge
- Efficient Verification
- Short communication
- Non-interactive
- Quantum-resilient (i.e. post-quantum)


## Proof Systems — Properties

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- Soundness


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- Efficient Verification
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When both verification time and communication is very small compared to the size of $C$, we say that the proof system is
succinct.

- Non-interactive


## Proof Systems - Properties

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- Soundness


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succinct.

- Non-interactive


SNARK: Succinct $\underline{\text { Non-Interactive Arguments of Knowledge }}$

## State of the Art of the SNARK Technology



## Timeline


[GMR85] The Knowledge Complexity of Interactive Proof-Systems.
Goldwasser, Micali, Rackoff. 1885

Seminal article introducing the zero-knowledge proofs

## Timeline


[BCCT11] From Extractable Collision Resistance to Succinct Non-Interactive Arguments of Knowledge, and Back Again. Bitansky, Canetti, Chiesa, Tromer. 2011

Article that introduces the notion of zk-SNARK.

## Timeline


[PGHR13] Pinocchio: Nearly Practical Verifiable
Computation. Parno, Gentry, Howell, Raykova. 2013

First practical SNARK for general computing.

## Timeline


[Groth16] On the Size of Pairing-based Non-interactive Arguments. Groth. 2016

Highly efficient zk-SNARK (still very used).

Third Trusted Party



Prover


Verifier

Third Trusted Party


I prepare the proof environment.

- Sample a random value $r$.
- Generate a structured reference string

$$
\text { srs } \leftarrow \text { Procedure }(r)
$$

- Discard the toxic waste $r$.


Third Trusted Party


## Dealing with Trusted Setup

- Trusted Setup by Circuit:
the trusted set up works only
for the considered circuit $C$.
- Trusted Universal Setup:

> the trusted set up needs to be initiated only one (and will work for any circuit $C$ ).

- Transparent Setup: no trusted set up is need.



## Timeline


[BBBPWM17] Bulletproofs: Short Proofs for Confidential Transactions and More. Bünz, Bootle, Boneh, Poelstra, Wuille, Maxwell. 2017

One of the first efficient transparent proof systems (no efficient verification)

## Timeline


[BBHR18] Scalable, transparent, and post-quantum secure computational integrity. Ben-Sasson, Bentov, Horesh, Riabzev. 2018

One of the first efficient transparent and post-quantum proof systems

## Timeline



[GWC19] Plonk: Permutations over Lagrange-bases for Oecumenical
Noninteractive arguments of Knowledge. Gabizon, Williamson, Ciobotaru. 2019

Practically-efficient proof system relying on universal setup

## A (non-exhaustive) list of proof systems

| ZKP System | Publication year | Protocol | Transparent | Universal | Plausibly Post-Quantum Secure | Programming Paradigm |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| Pinocchio ${ }^{[36]}$ | 2013 | zk-SNARK | No | No | No | Procedural |
| Geppetto ${ }^{[37]}$ | 2015 | zk-SNARK | No | No | No | Procedural |
| TinyRAM ${ }^{[38]}$ | 2013 | zk-SNARK | No | No | No | Procedural |
| Buffet ${ }^{[39]}$ | 2015 | zk-SNARK | No | No | No | Procedural |
| ZoKrates ${ }^{[40]}$ | 2018 | zk-SNARK | No | No | No | Procedural |
| xJsnark ${ }^{[41]}$ | 2018 | zk-SNARK | No | No | No | Procedural |
| vRAM ${ }^{[42]}$ | 2018 | zk-SNARG | No | Yes | No | Assembly |
| vnTinyRAM ${ }^{[43]}$ | 2014 | zk-SNARK | No | Yes | No | Procedural |
| MIRAGE ${ }^{[44]}$ | 2020 | zk-SNARK | No | Yes | No | Arithmetic Circuits |
| Sonic ${ }^{[45]}$ | 2019 | zk-SNARK | No | Yes | No | Arithmetic Circuits |
| Marlin ${ }^{[46]}$ | 2020 | zk-SNARK | No | Yes | No | Arithmetic Circuits |
| PLONK ${ }^{[47]}$ | 2019 | zk-SNARK | No | Yes | No | Arithmetic Circuits |
| SuperSonic ${ }^{[48]}$ | 2020 | zk-SNARK | Yes | Yes | No | Arithmetic Circuits |
| Bulletproofs ${ }^{[24]}$ | 2018 | Bulletproofs | Yes | Yes | No | Arithmetic Circuits |
| Hyrax ${ }^{[49]}$ | 2018 | zk-SNARK | Yes | Yes | No | Arithmetic Circuits |
| Halo ${ }^{[50]}$ | 2019 | zk-SNARK | Yes | Yes | No | Arithmetic Circuits |
| Virgo ${ }^{[51]}$ | 2020 | zk-SNARK | Yes | Yes | Yes | Arithmetic Circuits |
| Ligero ${ }^{[52]}$ | 2017 | zk-SNARK | Yes | Yes | Yes | Arithmetic Circuits |
| Aurora ${ }^{[53]}$ | 2019 | zk-SNARK | Yes | Yes | Yes | Arithmetic Circuits |
| zk-STARK ${ }^{[54]}$ | 2019 | zk-STARK | Yes | Yes | Yes | Assembly |
| Zilch ${ }^{[35]}$ | 2021 | zk-STARK | Yes | Yes | Yes | Object-Oriented |

## A general SNARK framework



## A general SNARK framework



- Commitment scheme: commit a hidden value that we can reveal later.


Too simple to build efficient SNARK system.

## A general SNARK framework



- Commitment scheme: commit a hidden value that we can reveal later.
- Functional commitment scheme: commit a hidden function $f$ for which we can reveal some $\left\{f\left(x_{i}\right)\right\}_{i}$ later.


## A general SNARK framework



## A general SNARK framework



When there is a trusted setup, it is usually because of the functional commitment scheme.

## A general SNARK framework



Phase 1/2: Committing procedure

- We fix a wet of functions $\mathscr{F}=\{f: X \rightarrow Y\}$.
- The prover commits a given function $f \in \mathscr{F}$ :

$$
\operatorname{com}_{f} \leftarrow \operatorname{Com}^{\rho}(f) .
$$

- The prover sends the commitment $\operatorname{com}_{f}$ to the verifier.


## A general SNARK framework



Commitment schemes
Phase 1/2: Committing procedure

- We fix a wet of functions $\mathscr{F}=\{f: X \rightarrow y /\}$.
- The prover commits a given functio $f \in \mathscr{F}$ :

$$
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$$

usually rely on some randomness $\rho$ to hide the committed data.

- The prover sends the commitment $\operatorname{com}_{f}$ to the verifier.


## A general SNARK framework



Phase 2/2: Verifying procedure

- The verifier sends some $x \in X$ to the prover.
- The prover replies with proof $\pi$ together with some $y \in Y$.
- The verifier uses the proof $\pi$ to verify that $f(x)=y$ and $f \in \mathscr{F}$.
- The verifier accept the claim iff the proof $\pi$ is valid.


## A general SNARK framework



## A general SNARK framework



The set $\mathscr{F}$ is all the univariate polynomials of degree less or equal to $d$ in a specific field:

$$
\mathscr{F}=\mathbb{F}^{\leq d}[X]
$$

KZG and FRI are famous polynomial commitment schemes.

## A general SNARK framework



The set $\mathscr{F}$ is all the multivariate polynomials of degree at most 1:

$$
\mathscr{F}=\mathbb{F}^{\leq 1}\left[X_{1}, \ldots, X_{n}\right]
$$

For example:

$$
f_{1}\left(X_{1}, X_{2}, X_{3}\right)=5+3 X_{2}+X_{3} \quad \text { or } \quad f_{2}\left(X_{1}, X_{2}, X_{3}\right)=X_{1}+X_{2}+X_{3}
$$

## A general SNARK framework



The set $\mathscr{F}$ is all the functions that are represented by vectors: we commit to a vector a dimension $d$.

$$
\mathscr{F}=\left\{f_{\vec{u}}: i \mapsto u_{i}, \vec{u}:=\left(u_{1}, \ldots, u_{d}\right)\right\}
$$

Such a commitment scheme simply commits to a vector and enables us to reveal only few coordinates (and not the entire vector).

## A general SNARK framework



The set $\mathscr{F}$ is all the functions that are represented by vectors: we commit to a vector a dimension $d$.

$$
\mathscr{F}=\left\{f_{\vec{u}}: \vec{v} \mapsto\langle\vec{u}, \vec{v}\rangle\right\}
$$

Such a commitment scheme simply commits to a vector and enables us to reveal only linear combinations of the coordinates.

## Arithmetisation



## Arithmetisation



## R1CS (Rank-1 Constraint Systems):

I know $w$ such that the output of $C(x, w)$ is $y$.
$\Longrightarrow I$ know $\bar{w}$ such that $(A \bar{w}) \circ(B \bar{w})=C \bar{w}$.

## Applications

## Authentication



## Authentication



## Authentication <br> 



## Authentication



## Authentication <br> manamen



## Identification

Scheme

## Authentication



Identification

## Scheme

Can be transformed into (Fiat-Shamir transformation)

Signature Scheme

## Computation Delegation

## Cloud



Computer


## Computation Delegation



## Computation Delegation

Computing


## Computation Delegation

Computing


## Computation Delegation (Blockchain)



ETH state


Should check the validity of each transaction
It scales linearly into the number of transactions $\Longrightarrow$ It costs a lot of gaz.

## Computation Delegation (Blockchain)

Proof $\pi$ that all
the $n$ transactions are valid

Should need check the validity
ETH state of each validity proof



New
ETH state

## Fighting Disinformation

## How to verify where and when a photography was taken?

The Coalition for Content Provenance and Authenticity (C2PA) proposed a standard to verify image provenance that relies on digital signatures.

Cameras would "digitally sign" each photo taken along with a series of assertions about the photo (e.g., location, timestamp).

## Fighting Disinformation

Cameras would "digitally sign" each photo taken along with a series of assertions about the photo (e.g., location, timestamp).

But in practice, the photos are often cropped, resized (etc.) before publishing. The photo signature would not be valid anymore.

When modifying a photo, we can produce a proof that the resulting photo corresponds to the original signed photos with a list of edits.

## Conclusion

## Conclusion

- Proof Systems:
- Main properties:

Completeness \& Soundness

- Additional optional properties:

> Zero-Knowledge, Efficient Verification, Short Communication, Non-interactive, Quantum-Resilient
$\square$ SNARK: Succinct Non-interactive Argument of Knowledge

- Introduced in 2011
- Different setups: trusted setup by circuit, universal trusted setup, transparent setup
- SNARK = Functional Commitment Scheme + Interactive Oracle Proof


## Conclusion

- Applications of proof systems:
- Authentication (identification scheme)
- Computation Delegation
- Many use cases in blockchain
- Disinformation Fight
- E-voting
- ...


## Thank you for your attention !

